

Possible Ways of Visualizing Uncertainty

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Goals

- Show some uncertainty visualization and apply them to illustrative problem
- Highlight visualization challenges and issues for working group discussion



Caveats

- Approximately. 2 months to learn about problem and create some representative visualization
- unequal amount of time spent on each data set / bubble
- propagated uncertainty, not delta's
- different target users, needs, etc.

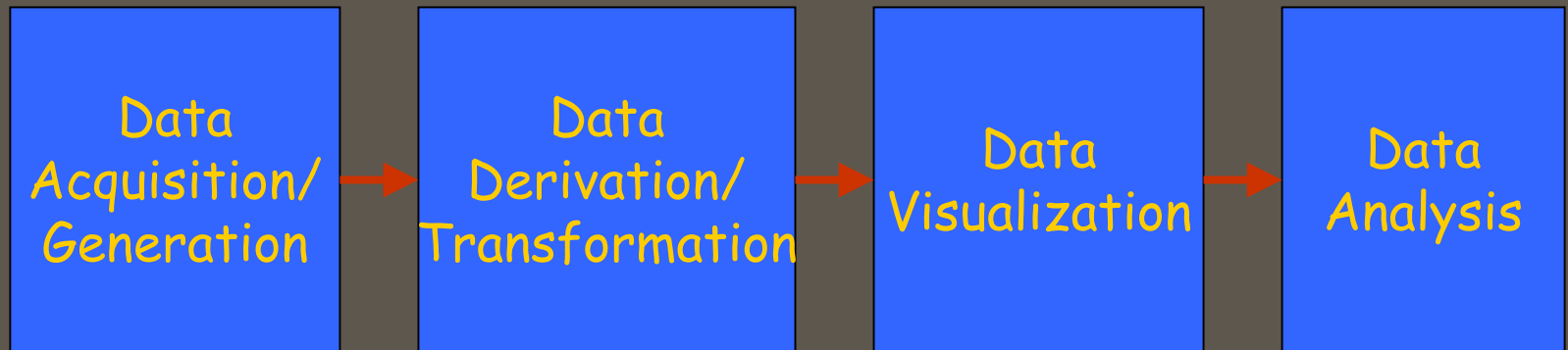


Why Uncertainty Visualization

- big data (cannot visualize everything)
- little data (filling in the holes)
- noisy, spotty data
- conflicting data / measurements
 - multiple algorithms
 - multiple models, geometries, ...



Sources of Uncertainty

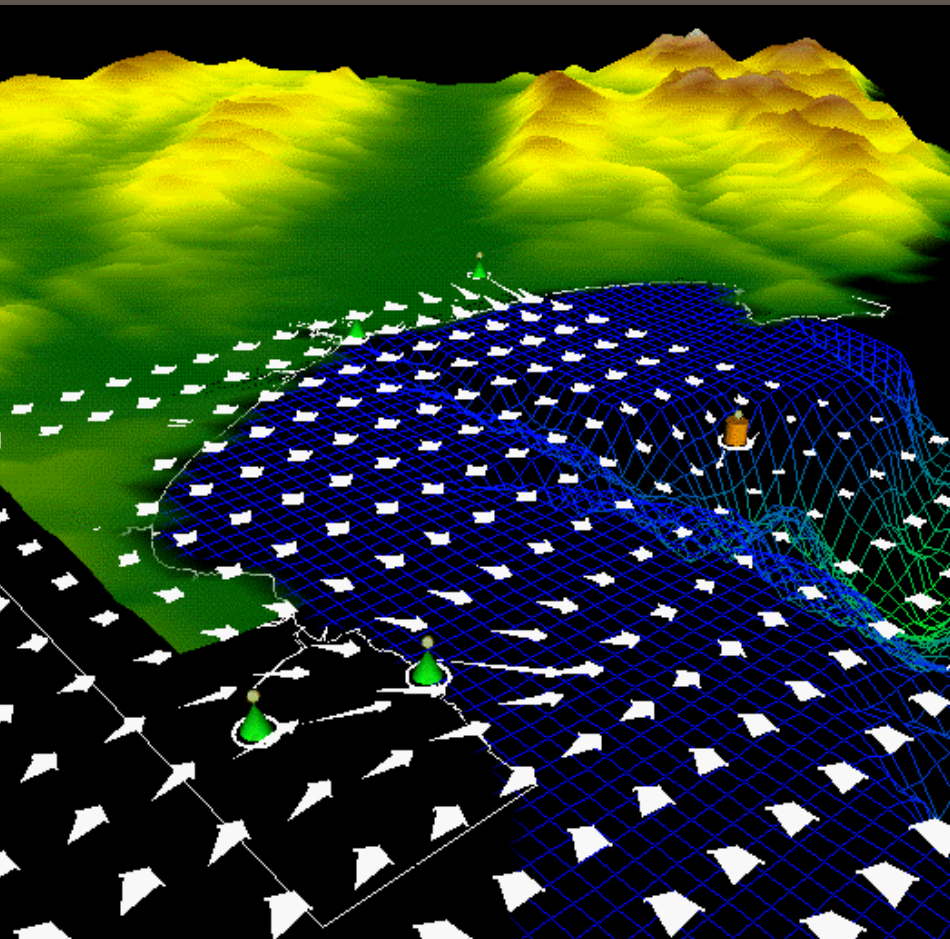


- Simplifications in modeling, unknowns in environments, ...
- Calibration drifts, range, resolution, ...
- Numerical accuracy, parameter sensitivity, ...
- resampling, interpolation, visualization, ...

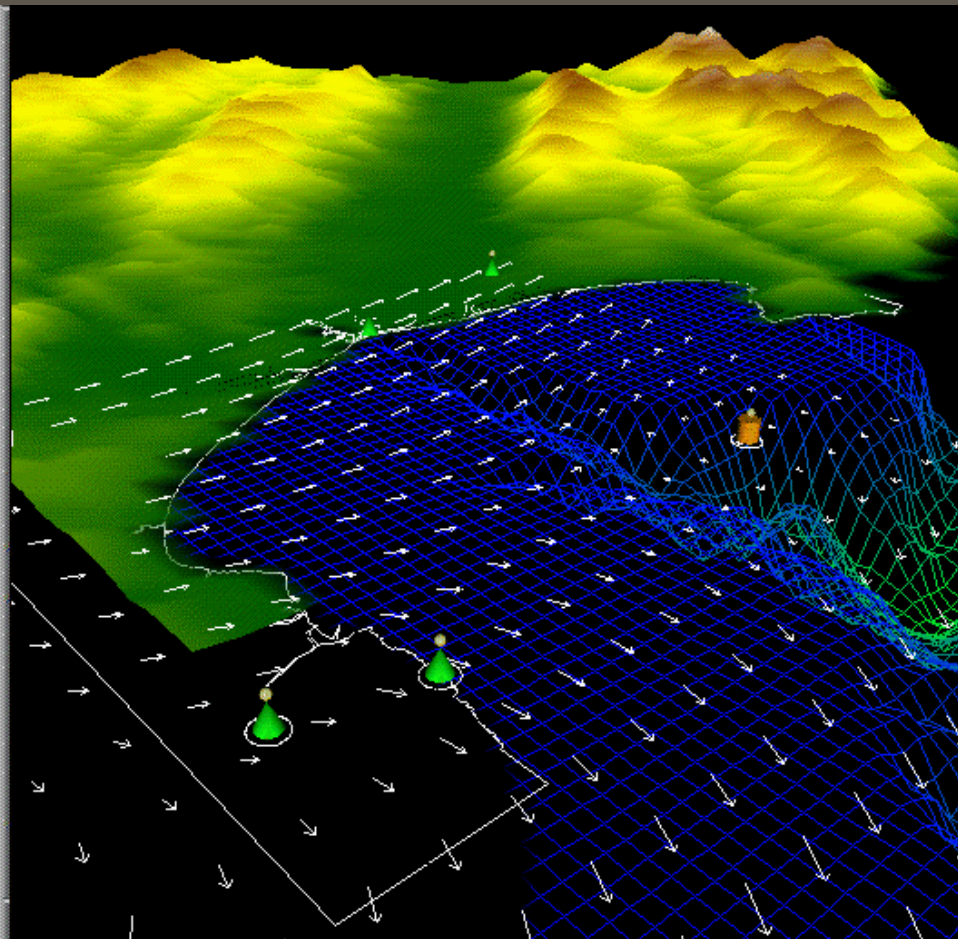


Some Uncertainty Vis'n

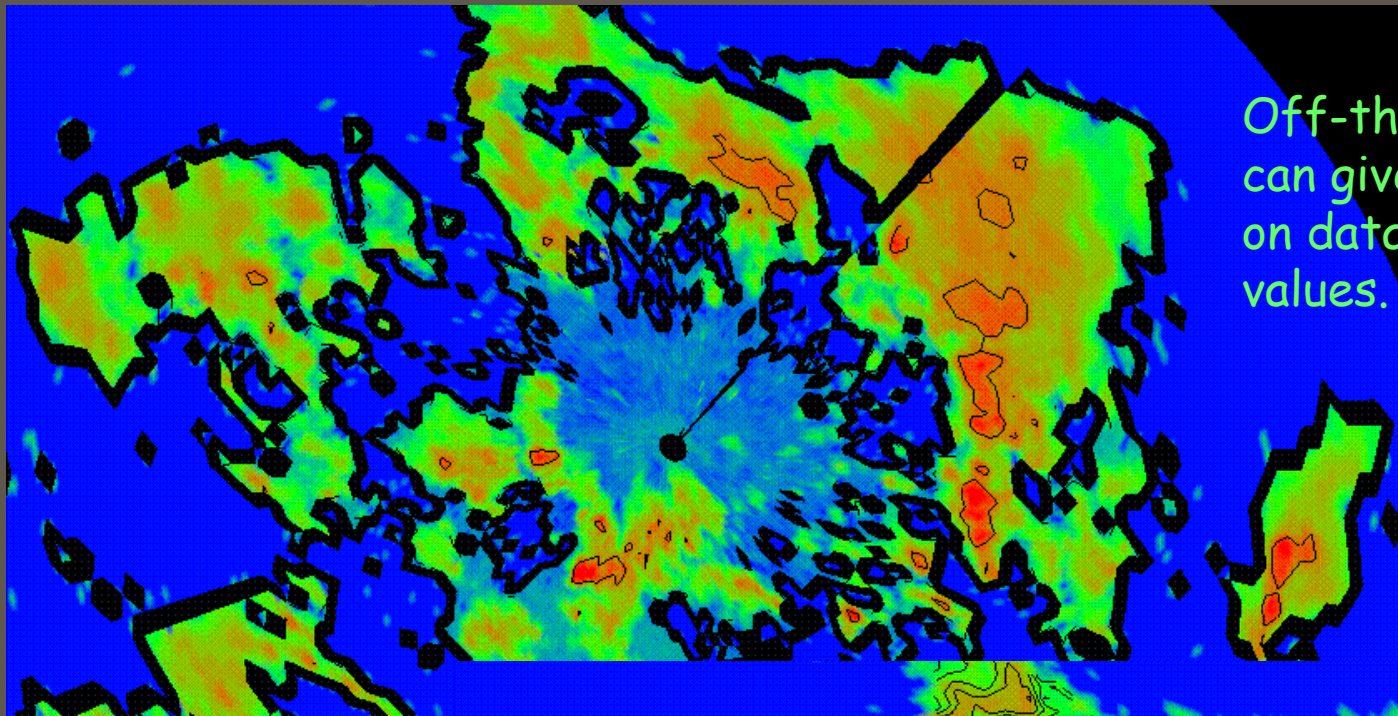
- 0 dimension -- glyphs
- 2 dimensions -- contours
- 3 dimensions -- isosurfaces,
volume rendering



Uncertainty glyphs can encode uncertainty in vector direction and magnitude

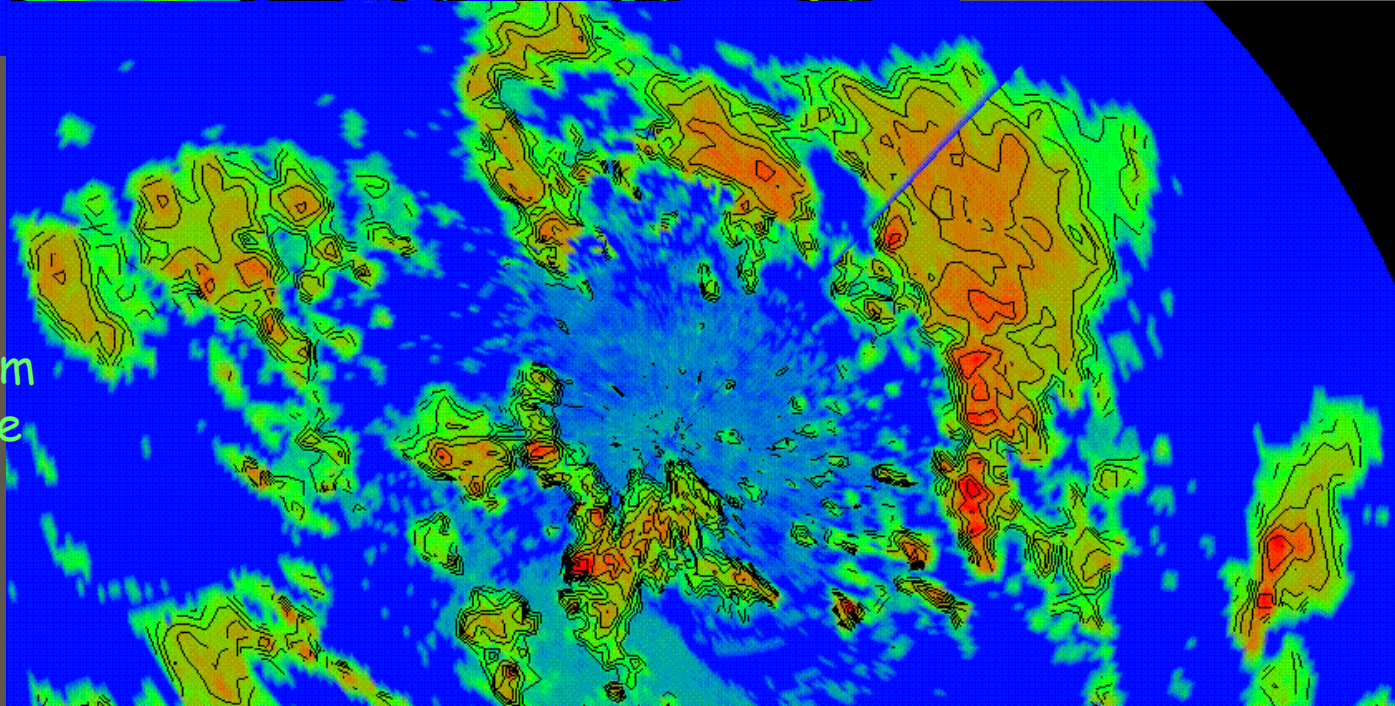


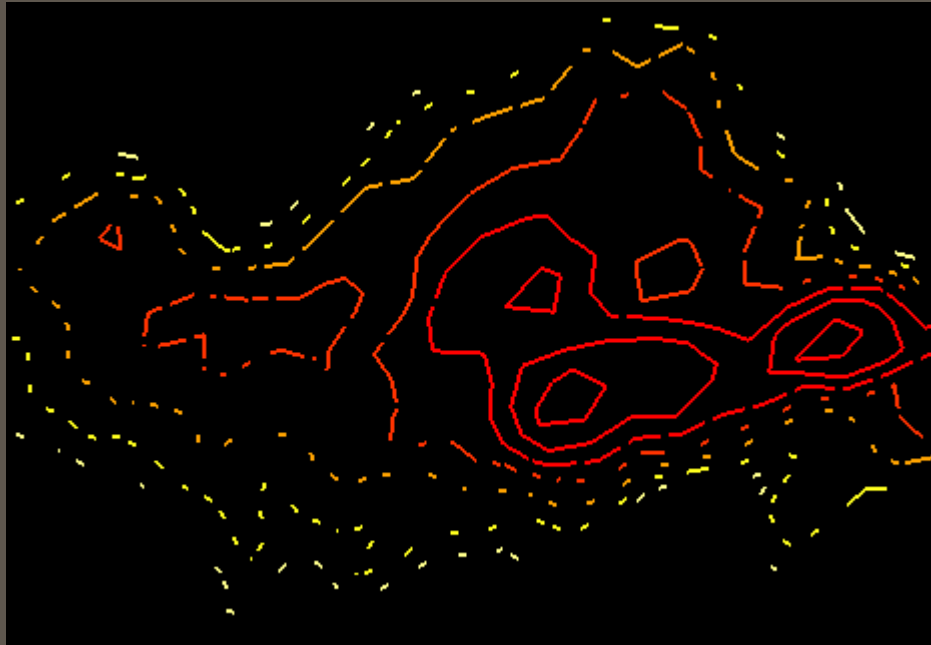
Regular arrow glyphs give false sense accurate vector heading and magnitude.



Off-the-shelf software
can give incorrect contours
on data with lots of missing
values.

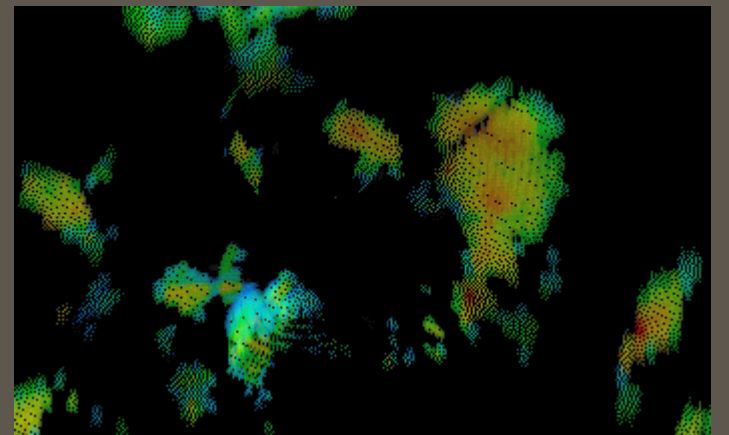
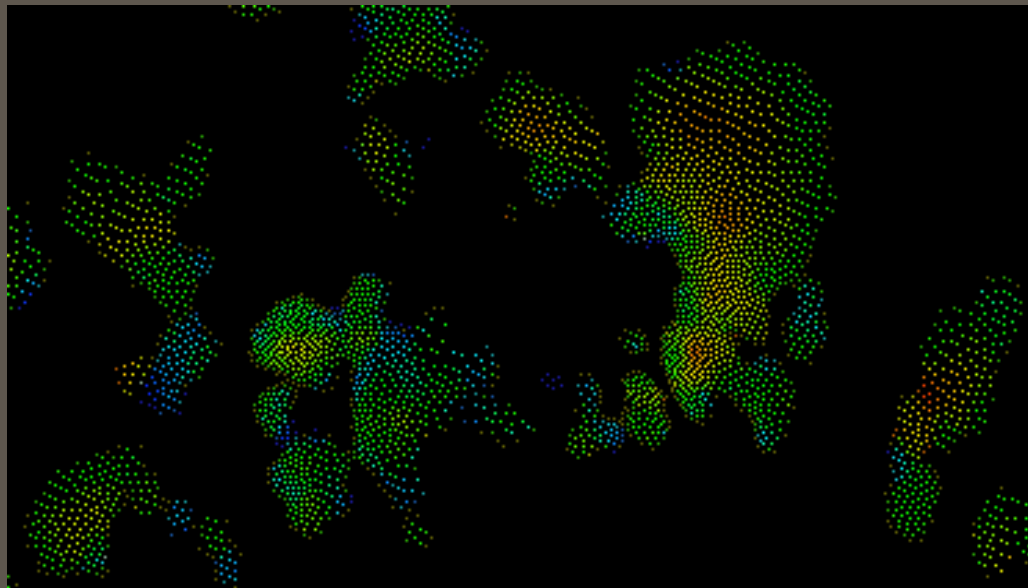
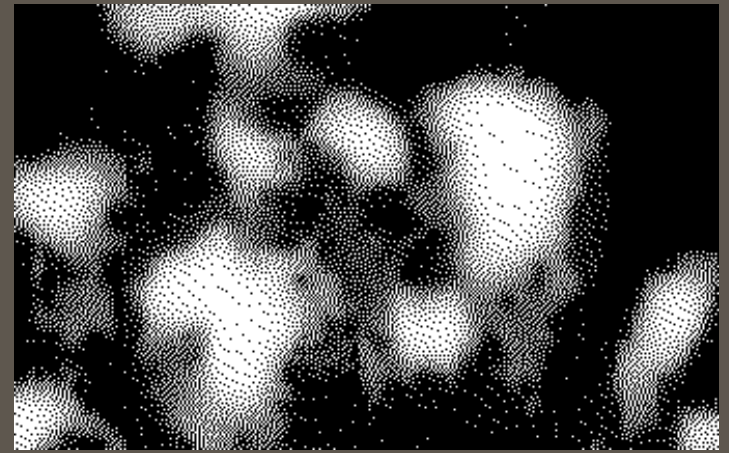
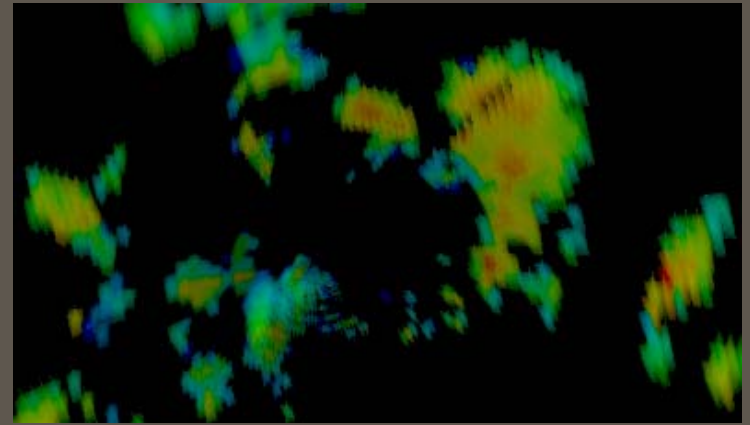
Modifications to
contouring algorithm
to account for large
number of missing
values.





Modification to contour algorithm to give indication of uncertainty using dashed lines. Solid lines indicate regions higher certainty in the underlying data.

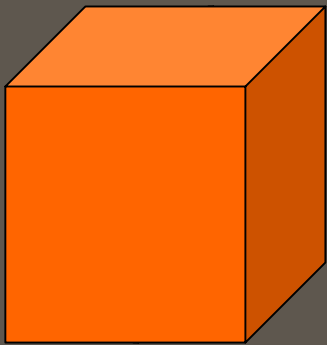
Volume rendering indicating uncertainty information in the data. Here, the data field and the uncertainty information fields are volume rendered independently. A post-process speckle is applied to the latter and used to composite with the former to produce the resulting images on the bottom.





Illustrative Problem Overview

Ocean

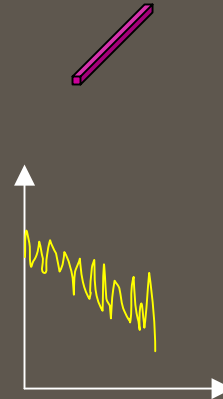


Environmental
uncertainty

Acoustic/Signal Processing



"days"



Propagation
loss

"minutes"

Target estimate



Bearing,
detection
likelihood

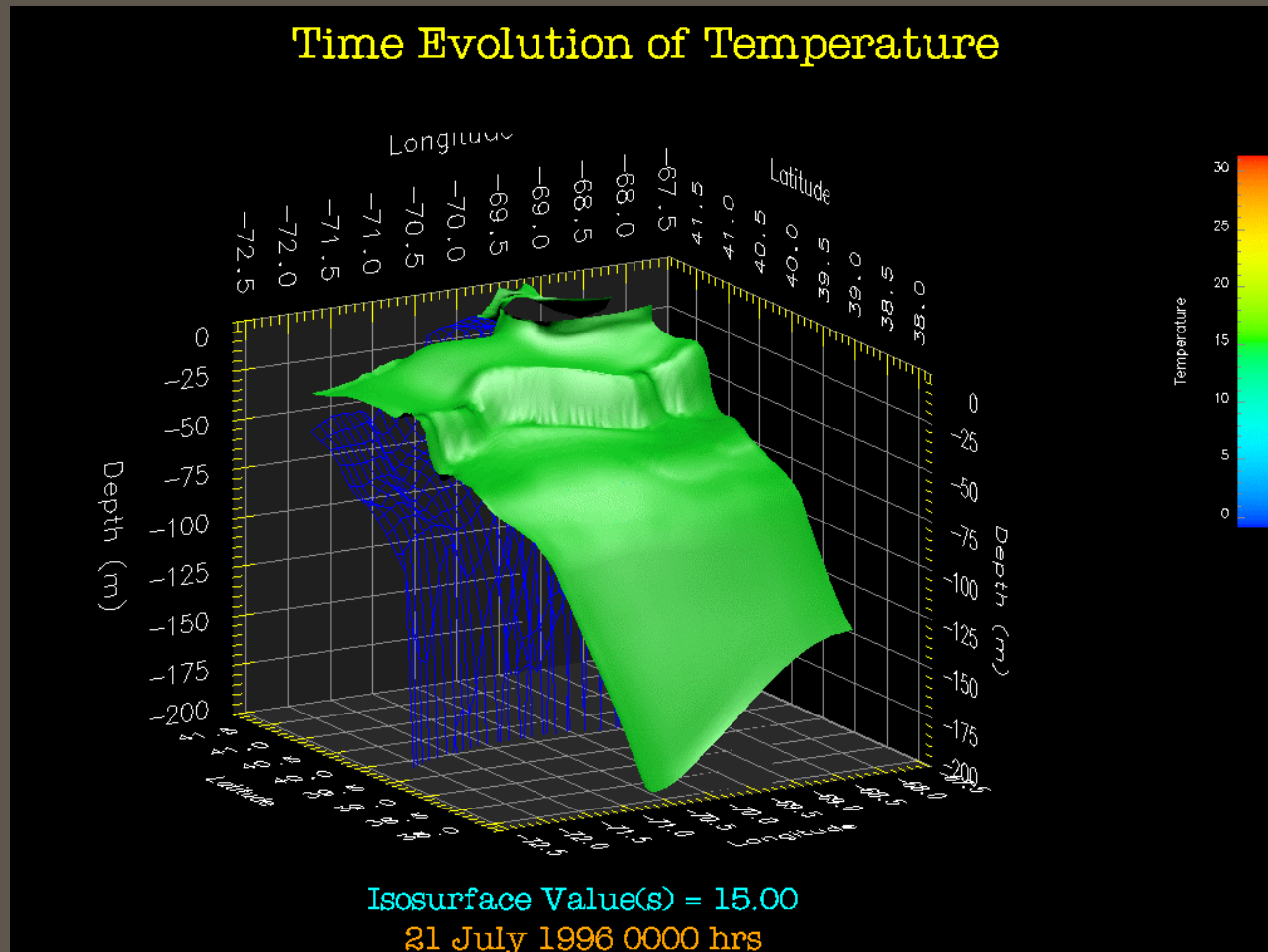


Ocean Model

- 3D + time:
 - 4 frames / day
 - $72 \times 65 \times 42$ depths \times 81 frames
- Salinity, temperature, velocity
- Sound speed transects with statistics
- Mean & standard deviation derived from time frames

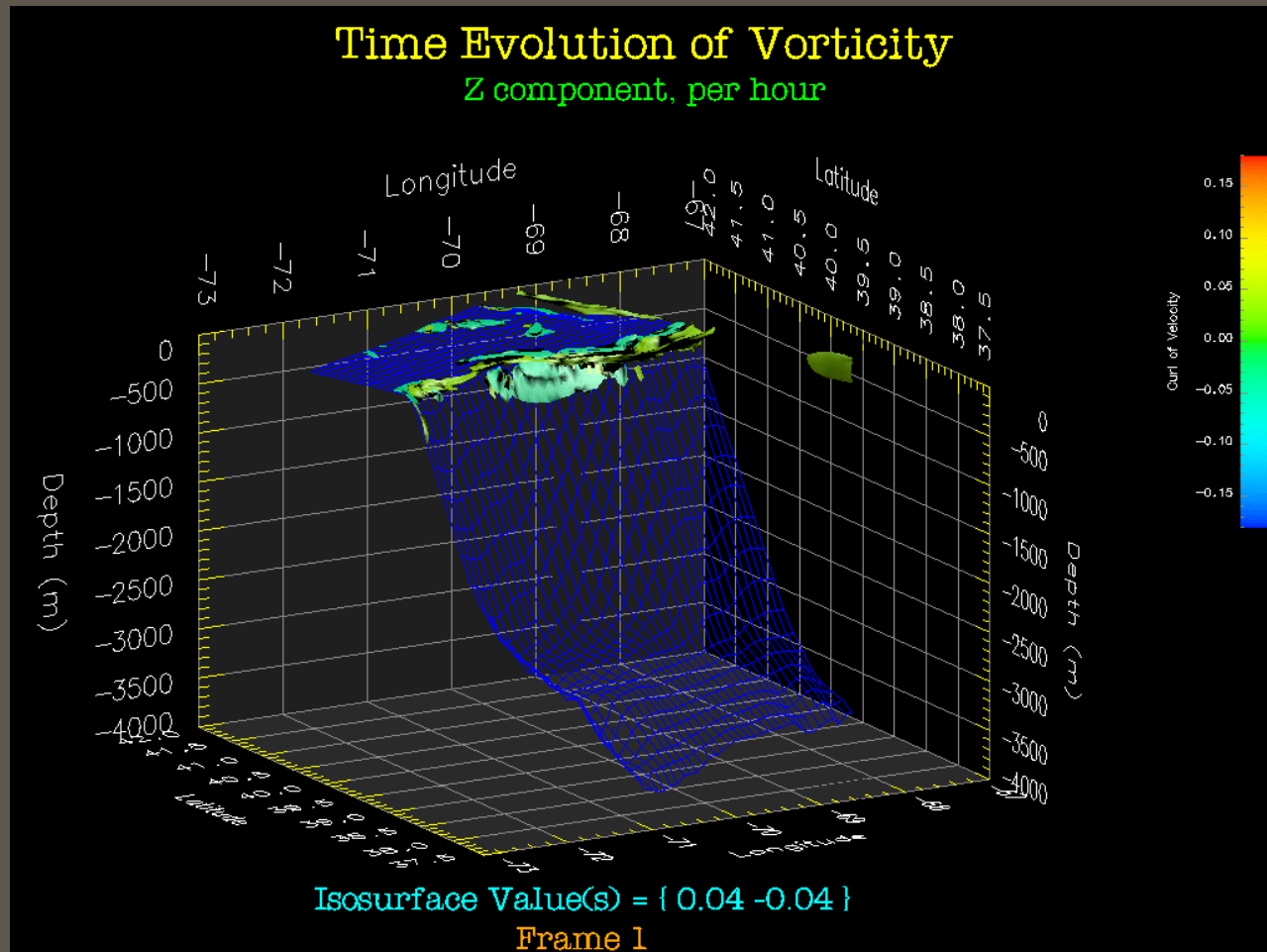


Temperature: 15C



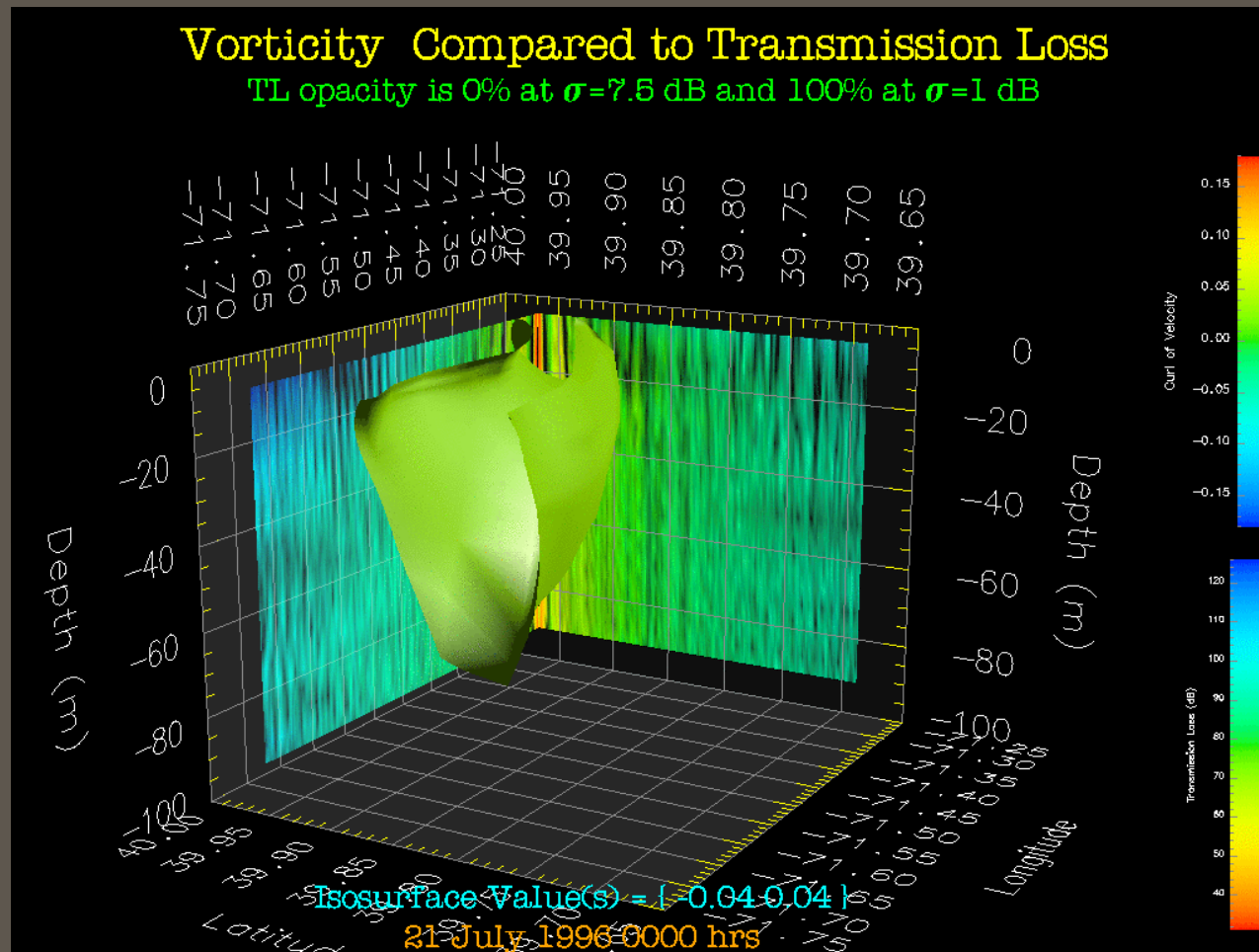


Vorticity field





Vorticity + TL

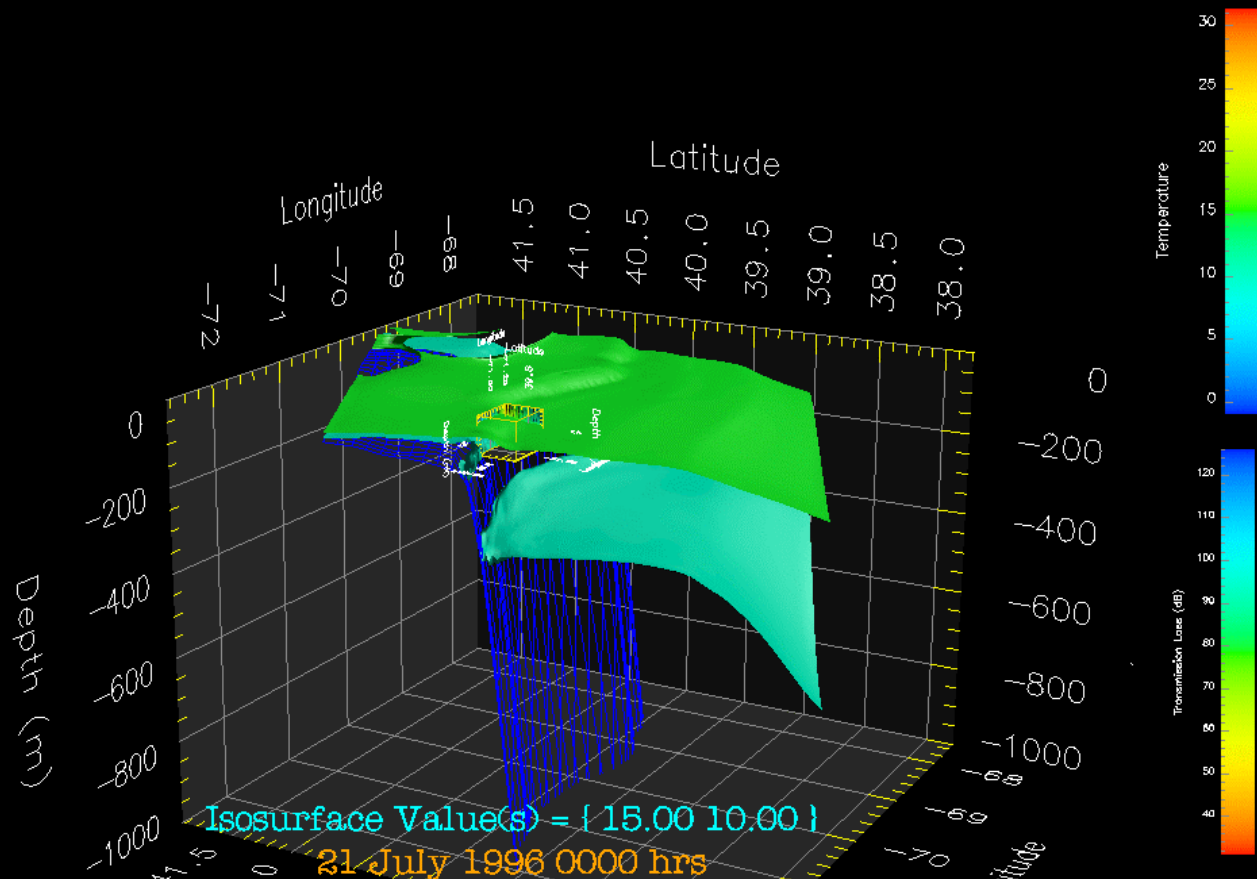




10C & 15C Temps & TL

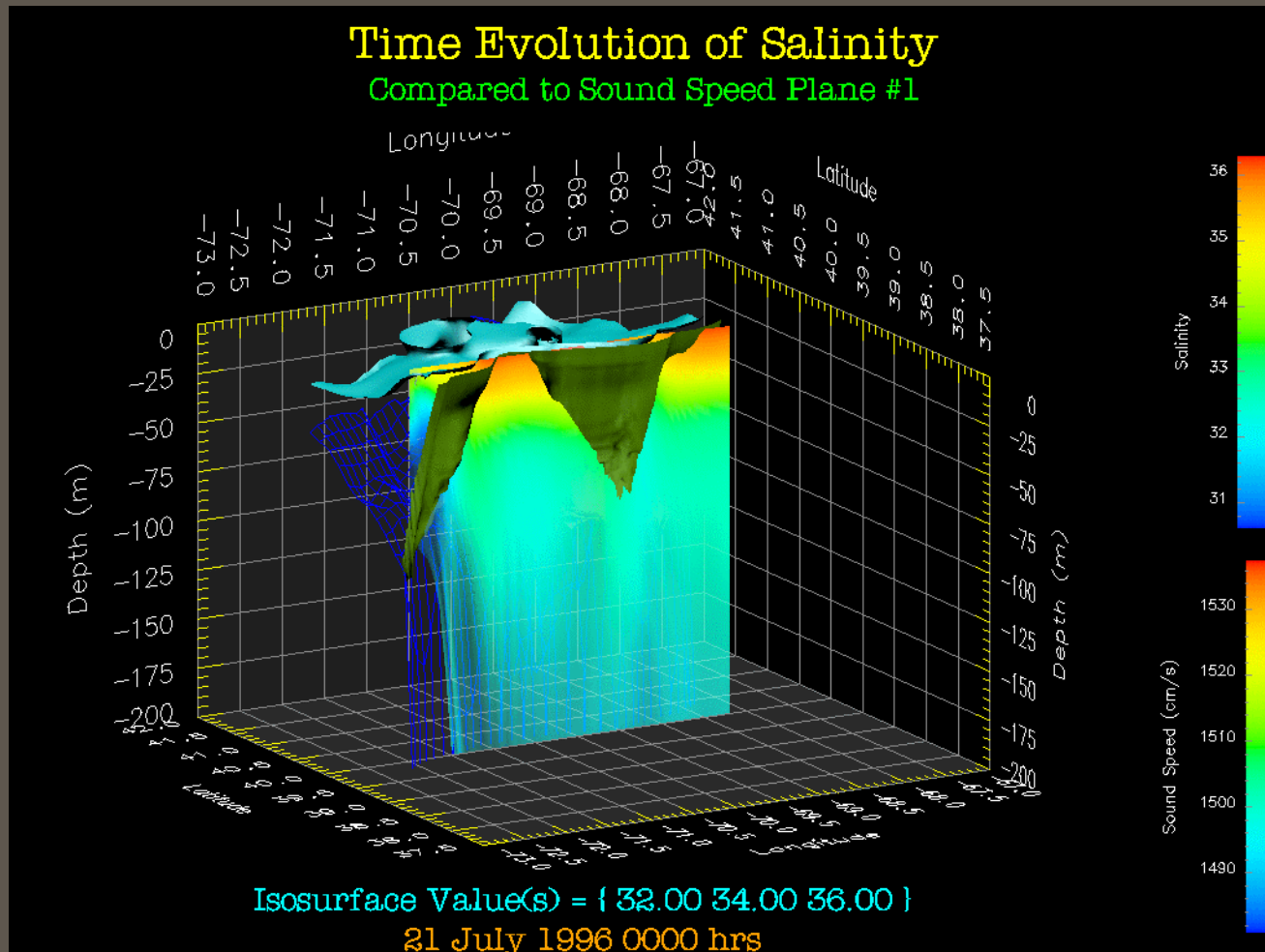
Temperature compared to Transmission Loss

TL opacity is 0% at $\sigma=7.5$ dB and 100% at $\sigma=1$ dB





Salinity + Soundspeed #1

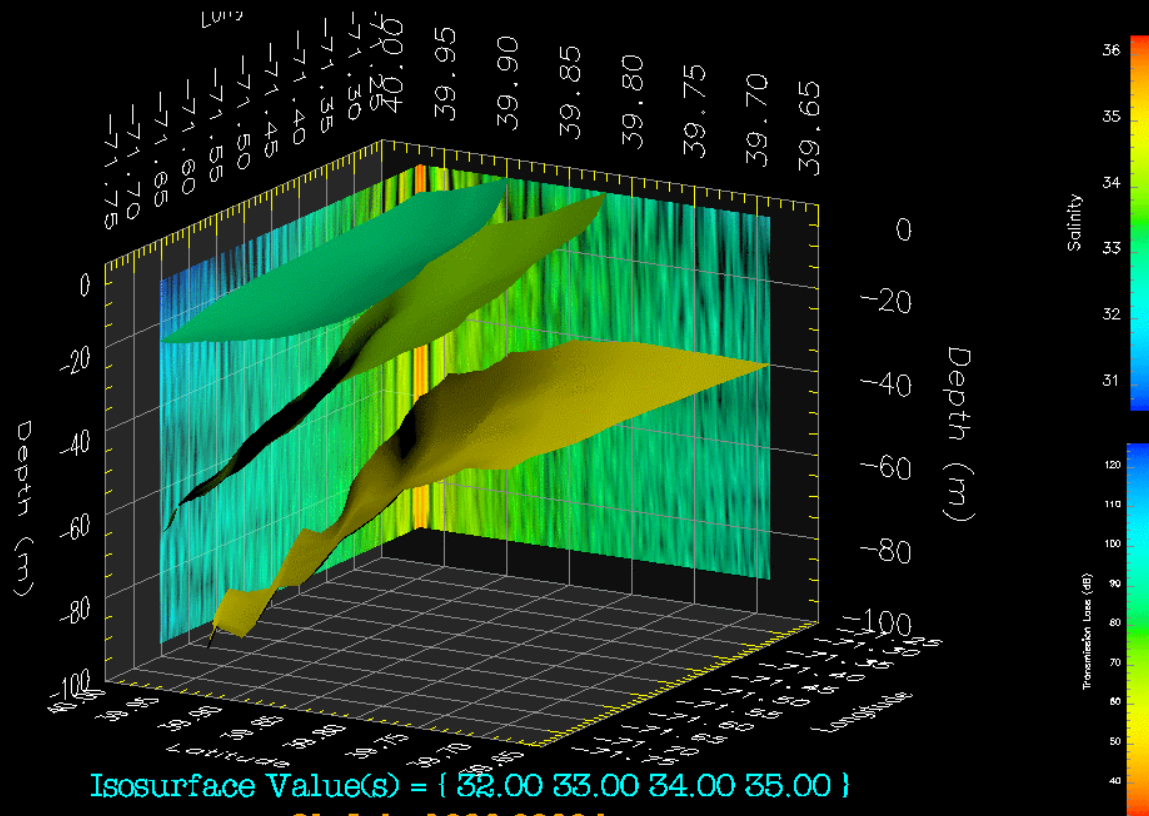




Salinity + TL

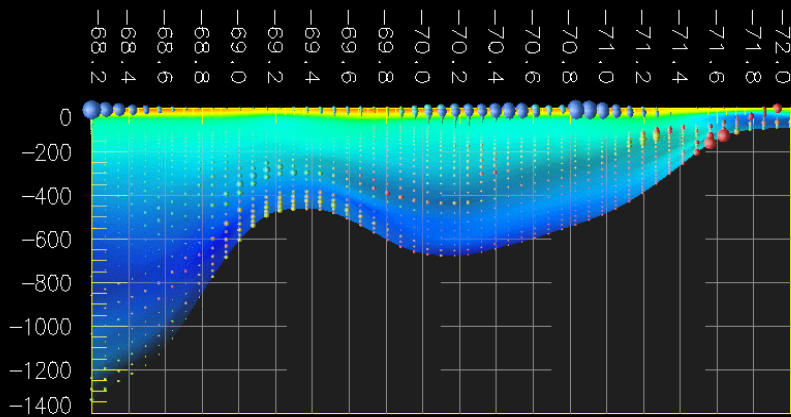
Salinity Compared to Transmission Loss

TL opacity is 0% at $\sigma=7.5$ dB and 100% at $\sigma=1$ dB

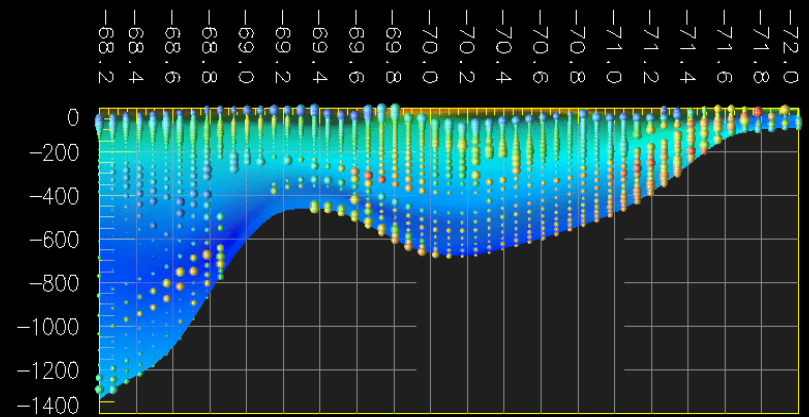




Soundspeed: var, kurt, skew



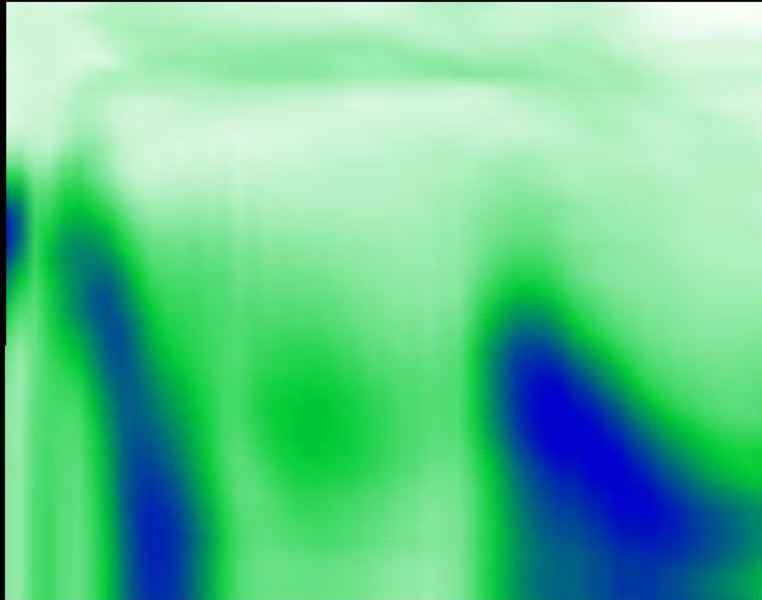
Color = soundspeed
transparency = low variance
glyph color = skewness (green = 0)
glyph size = kurtosis



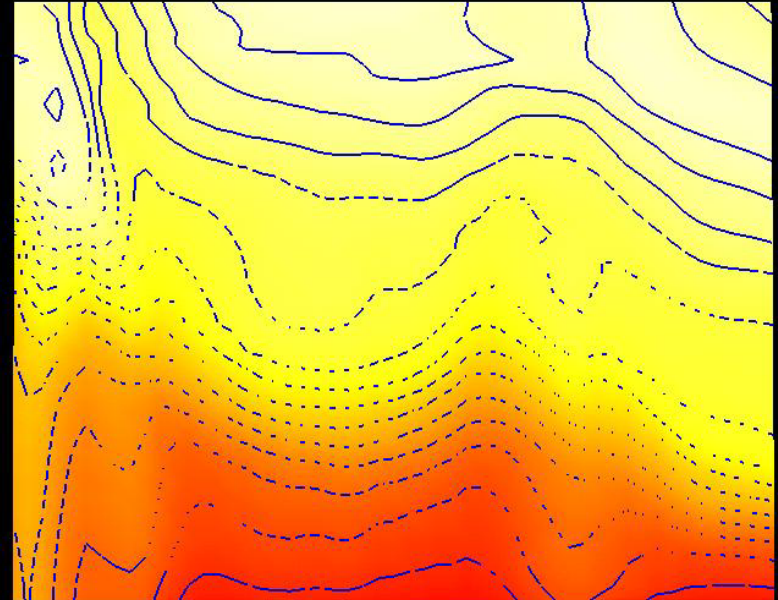
Color = soundspeed
transparency = high variance
glyph color = skewness (-1..1)
glyph size = kurtosis (2..4)



Soundspeed (42 levels, 80 realizations)



Standard deviation colored



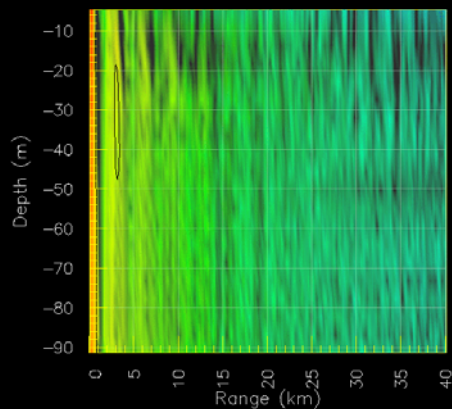
Soundspeed colored/contoured,
dashes based on sdev



Transmission Loss

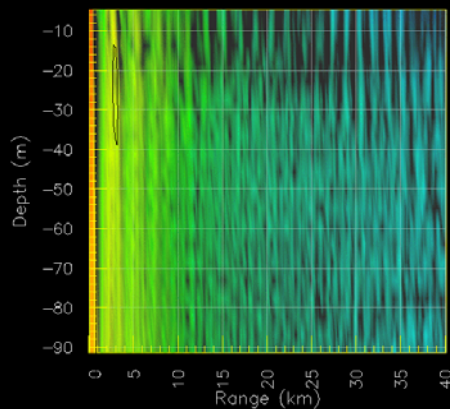
Transmission Loss (dB) for South Line

100% opacity at $\sigma=1$ dB; 0% opacity at $\sigma=7.5$ dB



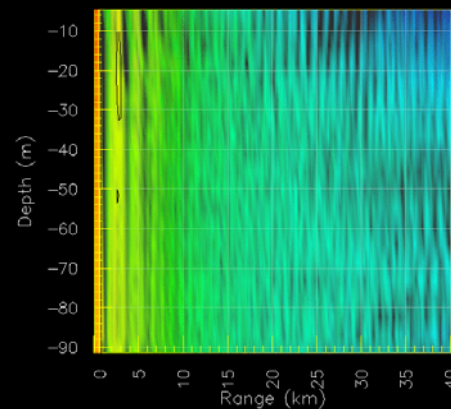
Transmission Loss (dB) for Diag Line

100% opacity at $\sigma=1$ dB; 0% opacity at $\sigma=7.5$ dB

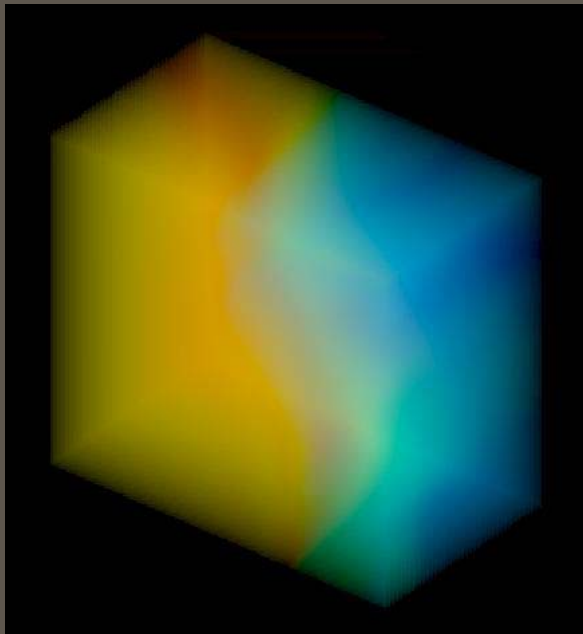
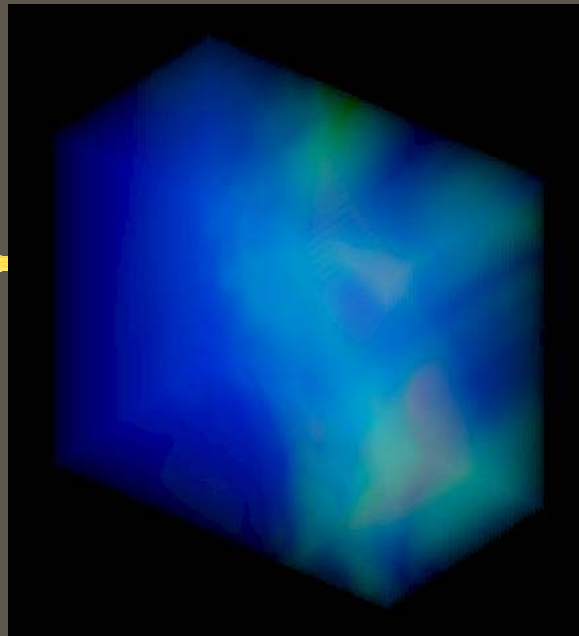


Transmission Loss (dB) for West Line

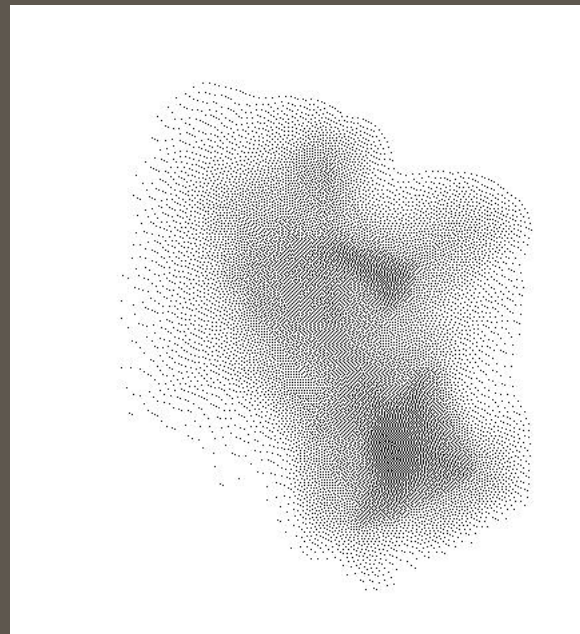
100% opacity at $\sigma=1$ dB; 0% opacity at $\sigma=7.5$ dB



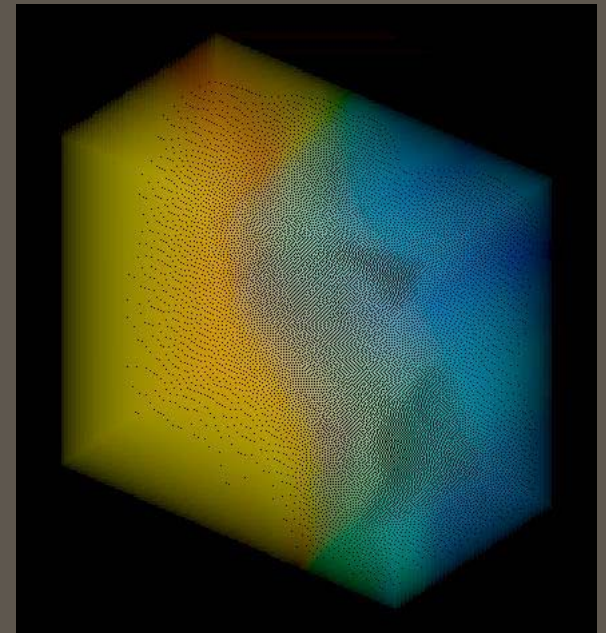
Color = transmission loss
transparency = variance



Mean salinity

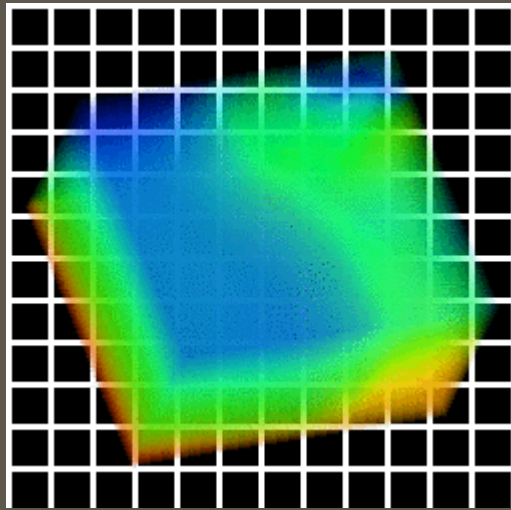


Sdev salinity

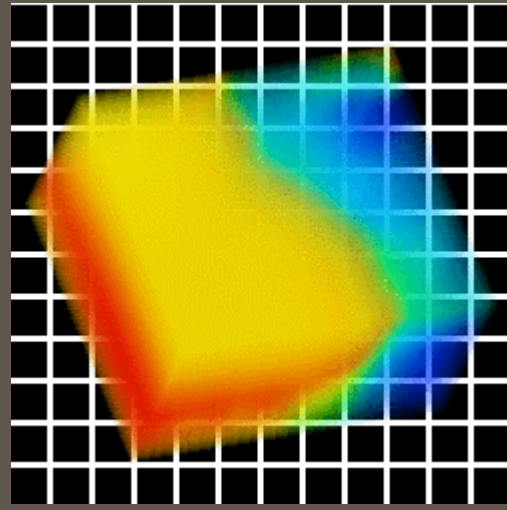




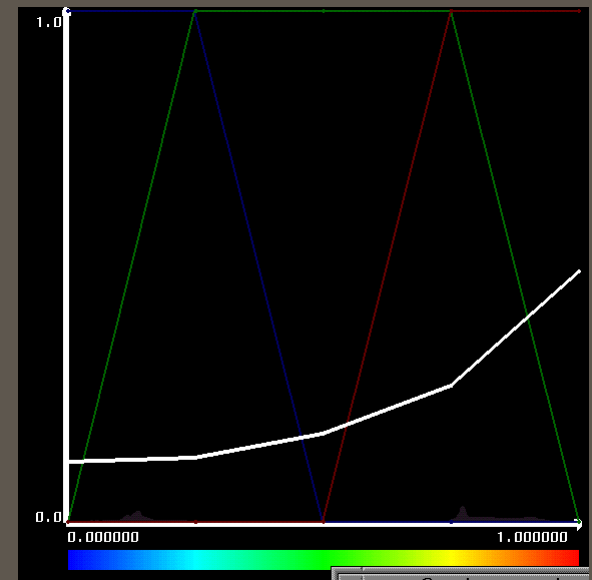
Increasing Opacity Mapping



temperature

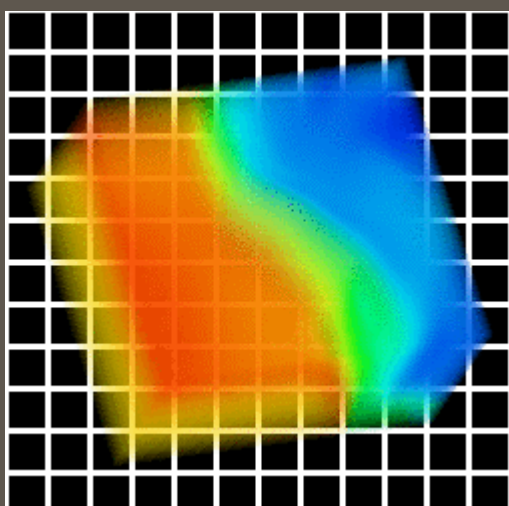
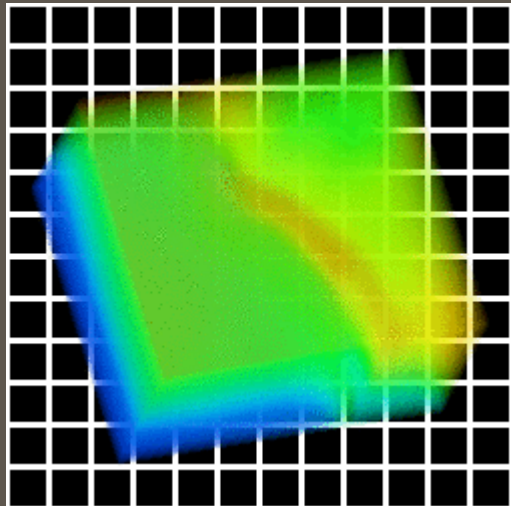
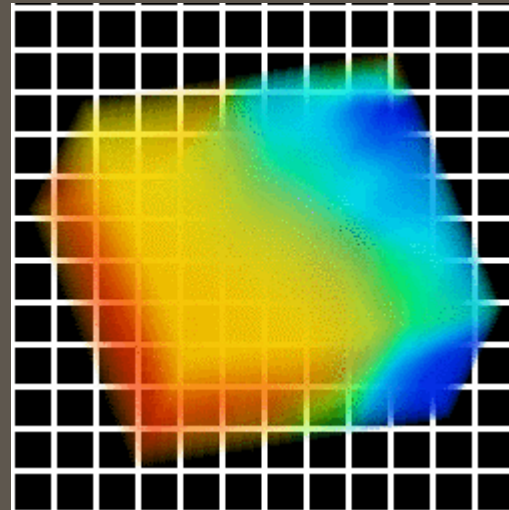
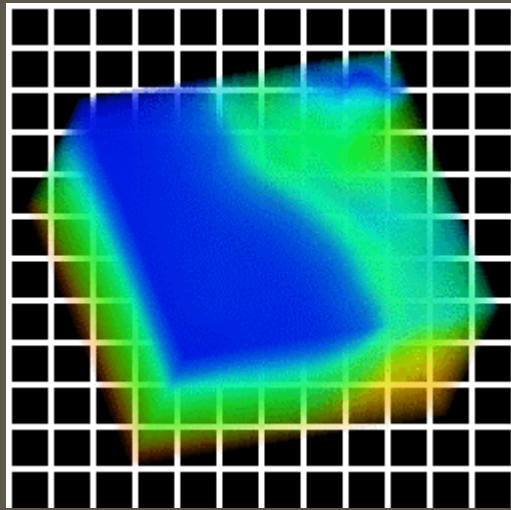


salinity



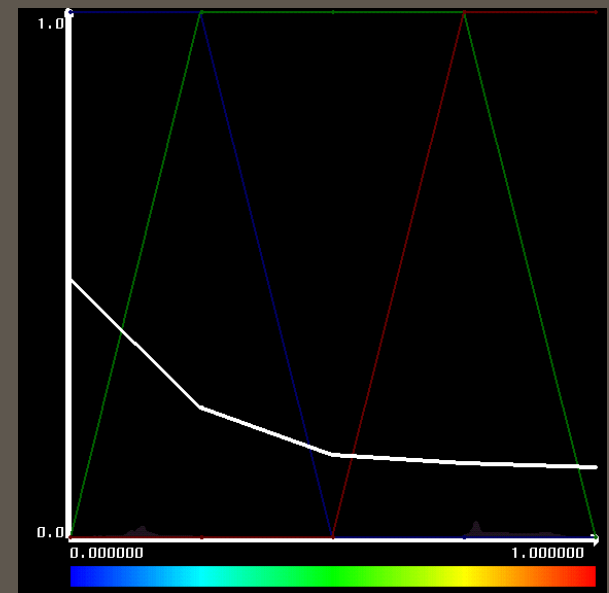


Decreasing Opacity Mapping



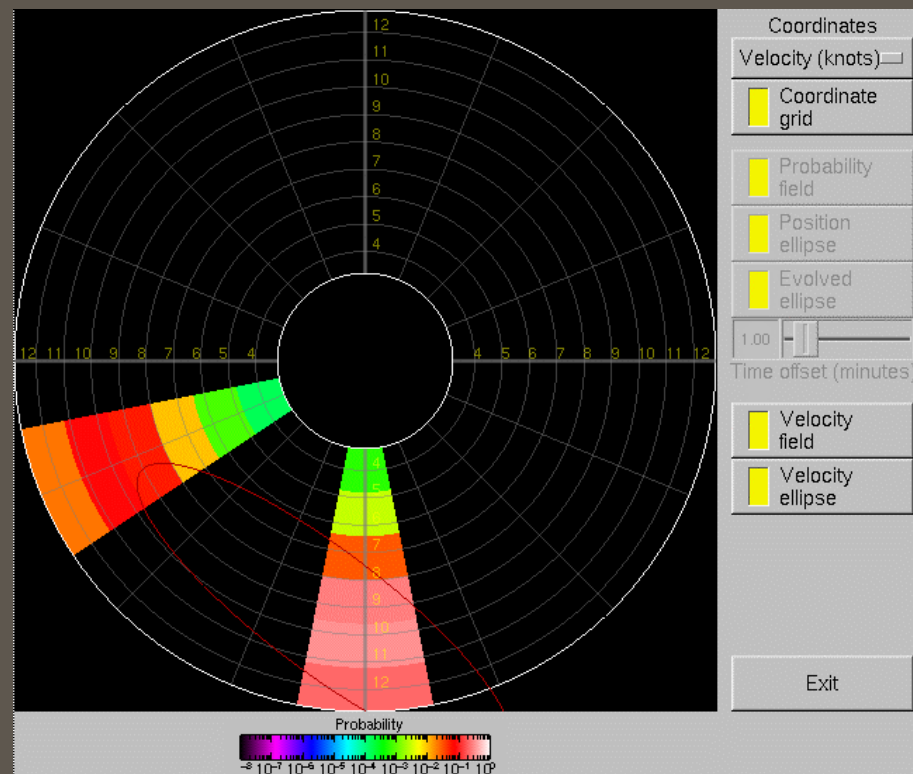
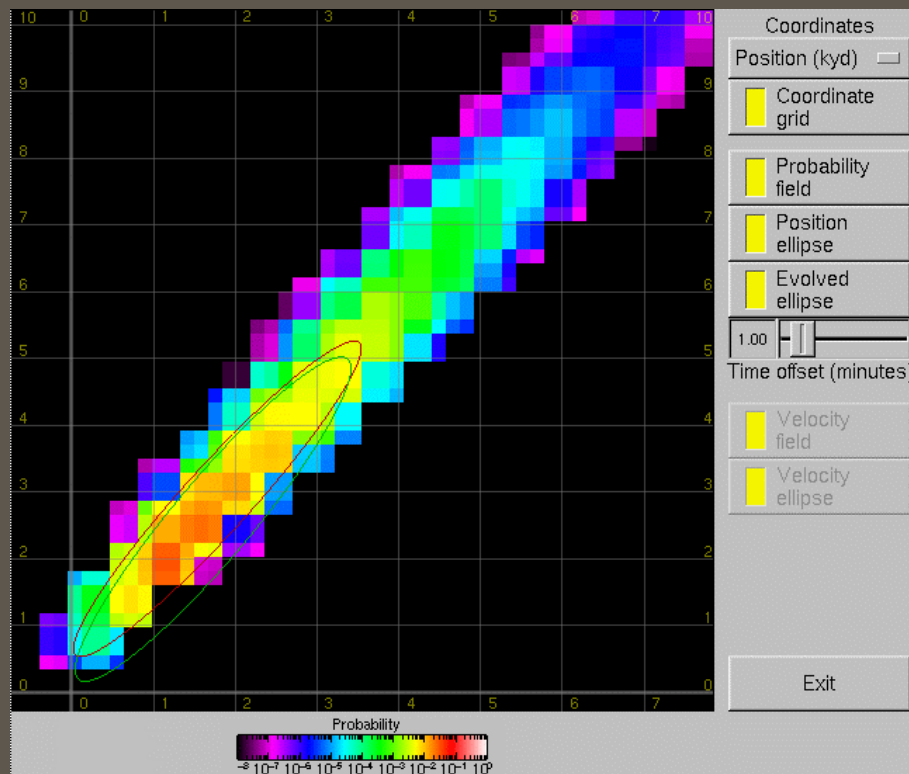
temperature

salinity





Target State Estimate



Position

Red ellipse = 2σ now

Grey ellipse = 3σ in 1 minute

Velocity



Visualization Challenges

- Uncertainty visualization
 - multi-dimensional visualization, visual mapping
 - range, standard deviation, pdfs, matrices, ..
 - ◆ Population size, pdf shape, etc.
 - Sonification & haptics
- Feature extraction & tracking
 - range displacements (location of caustic), fronts, convergence zones, acoustic inversion layers, temperature pockets/ducts/mixing, ...
- Comparative visualization
 - go beyond side-by-side
 - show propagation of uncertainty through process



Users

- Who are the users?
- What are they looking for in the data?
- What's important in the data?
- How is data currently being visualized?



Other Issues

- Data format (e.g. HDF, netCDF)
- Tools (e.g. matlab, opendx, avs)
- Uncertainty representation (scalar, distribution, etc.)
- Portability, web access
- Speed, cost



Summary

- Presented some uncertainty visualization techniques on different aspects of the illustrative problem
- Does not show effects of uncertainty transfer/propagation in end-to-end fashion
- Challenges in each and across the different bubbles in DRI schematic

Whew!